

# Optimization Models for Restaurant Revenue Management


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# The problem

- ▶ The floor manager of a restaurant has a party of 4 people waiting for a table and a free table of size 6
  - ▶ To sit or not to sit the party?
  - ▶ And, if there are more tables that are free...
  - ▶ Where to sit the party in order to maximize the revenue?
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# Revenue Management

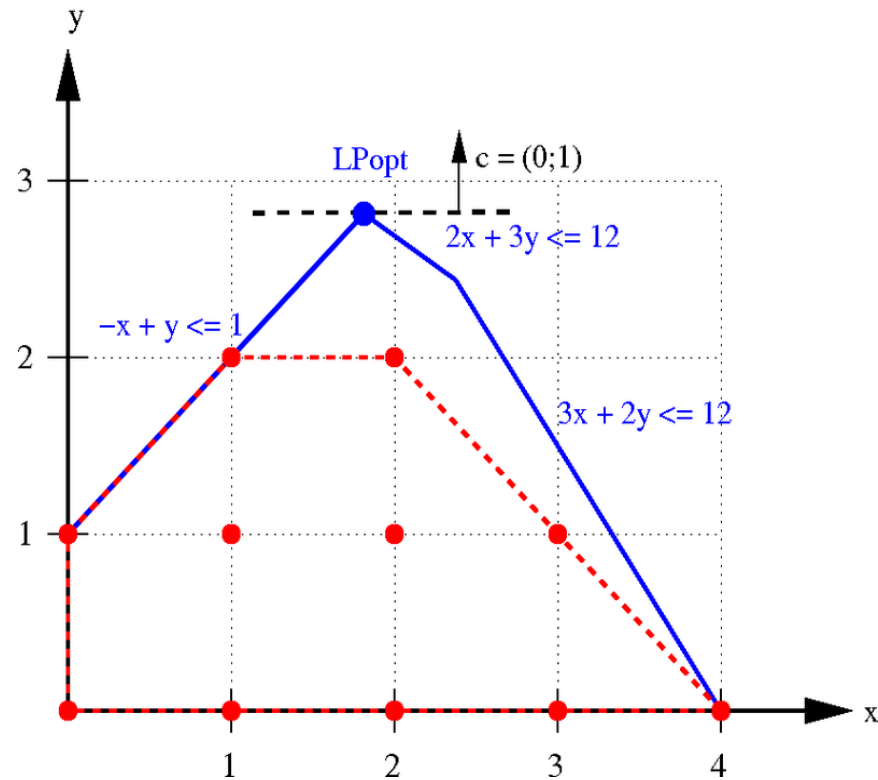
- ▶ Collection of strategies and tactics for manage demand
- ▶ Revenue management is concerned with the methodology and systems required to make demand management decisions, which can be categorized into
  - ▶ Structural decisions
  - ▶ Price decisions
  - ▶ Quantity decisions

# Revenue Management

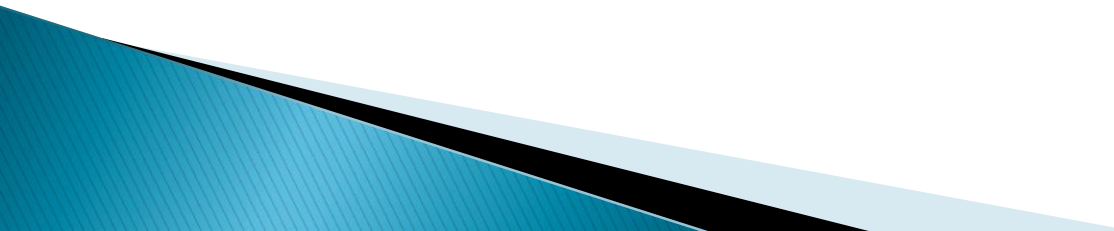
- ▶ Why can revenue management be useful for restaurants?
- ▶ It is used extensively in airlines, hotels, car industries and can be applied for restaurants
  - Focus on Quantity decisions

# Integer Linear Programming

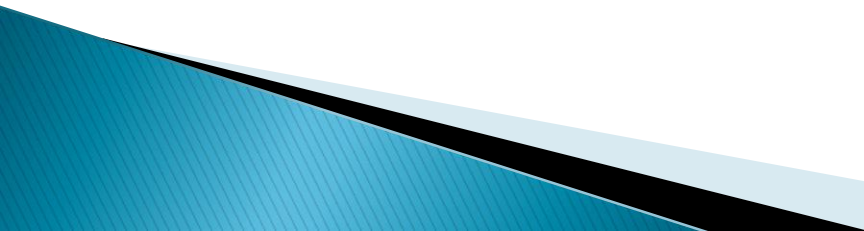
- ▶ Max  $y$
- ▶  $-x + y \leq 1$
- ▶  $3x + 2y \leq 12$
- ▶  $2x + 2y \leq 12$
- ▶  $x, y \geq 0$
- ▶  $x, y \in \mathbb{Z}$



# Two IP models

- ▶ Presented by Bertsimas and Shioda, will be implemented in AMPL and CPLEX
  - ▶ Basic Deterministic Model: will focus only on parties in the queue
  - ▶ Improved model: will make an estimations on future customers and behave accordingly
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# Basic Model

- ▶ The data needed are: the number of tables, the revenue for each party, the cost of denying service to a party,  $M$  and  $\eta$  (user-defined)
  - ▶ The state is: the current period, the parties in the queue, the parties seated
  - ▶ The decision variable is the number of party to be seated
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# Demand Constraints

$$\sum_{\substack{t'=now, \dots, T \\ k'=k, \dots, K}} q_{t,t',k,k'} + qdeny_{t,k} = Q_{t,k}$$

$$\forall t = 1, \dots, now; k = 2, \dots, K$$



# Seating-Capacity Constraints

$$\sum_{k=2, \dots, k'} \sum_{t, t'=1, \dots, T} q_{t, t', k, k'} + \sum_{k=2, \dots, k'} N_{k, k'}^s \leq c_{k'}$$

$$\forall k' = 2, \dots, K$$

# Fairness Constraints

$$\sum_{\substack{t=1,\dots,T \\ k'=k,\dots,K}} (Q_{t,k} - q_{t,now,k,k'}) \leq \left( \sum_{t=1,\dots,T} Q_{t,k} \right) z_{t,k}^q$$

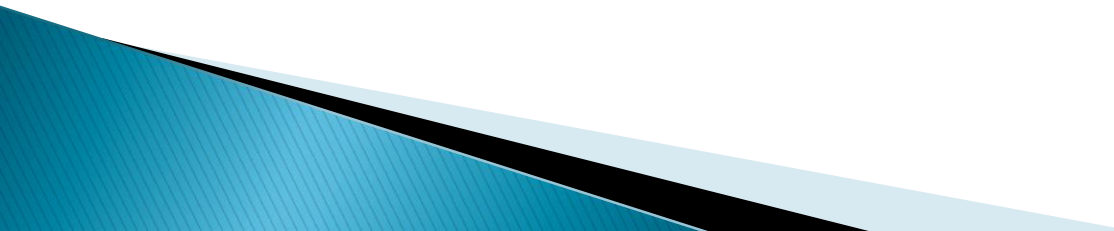
$$\sum_{k'=k,\dots,K} q_{t,now,k,k'} \leq L(1 - z_{t,k}^q)$$

$$\forall \quad t = 1, \dots, now; k = 2, \dots, K$$

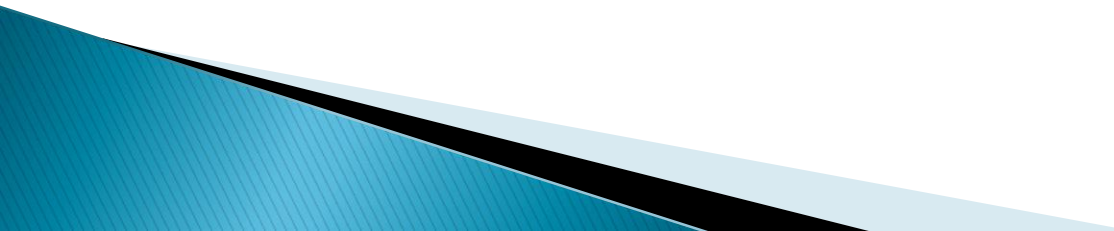
# Objective Function

$$\begin{aligned} \max \quad & \sum_{\substack{t=1, \dots, now \\ k=2, \dots, K}} \sum_{\substack{k'=k, \dots, K \\ t'=now, \dots, T}} (R_K - M(t'-t) - \eta(k'-k)) q_{t,t',k,k'} \\ & - \sum_{\substack{t=1, \dots, now \\ k=2, \dots, K}} Cost Q_{t,k} qdeny_{t,k} \end{aligned}$$

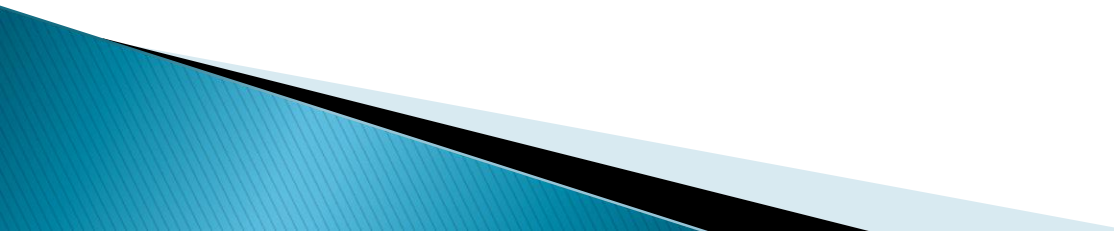
# Improved Model

- ▶ It will use all the data from the basic model plus an estimation on future parties and the cost of denying service to them
  - ▶ Few changes in the constraints and the objective function
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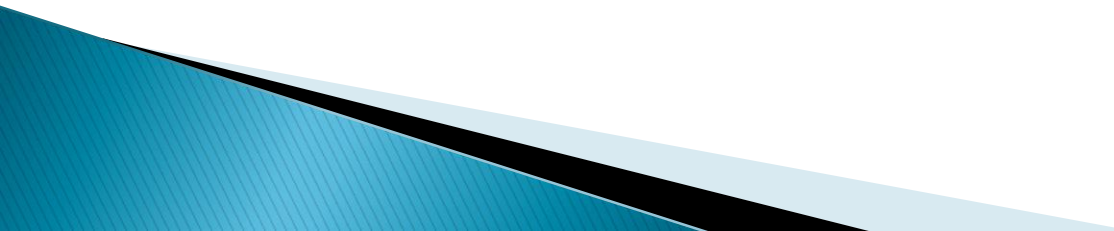
# AMPL & CPLEX

- ▶ AMPL: algebraic modeling language, it supports integer, quadratic, mixed-integer programming.
  - ▶ CPLEX: optimization software package. It is used to solve IP problems as well as various others
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# The Simulation

- ▶ The model at each period will:
    - ▶ Decide which party to seat, when and where
    - ▶ Seat the parties for the current period
    - ▶ Put the other parties in the queue
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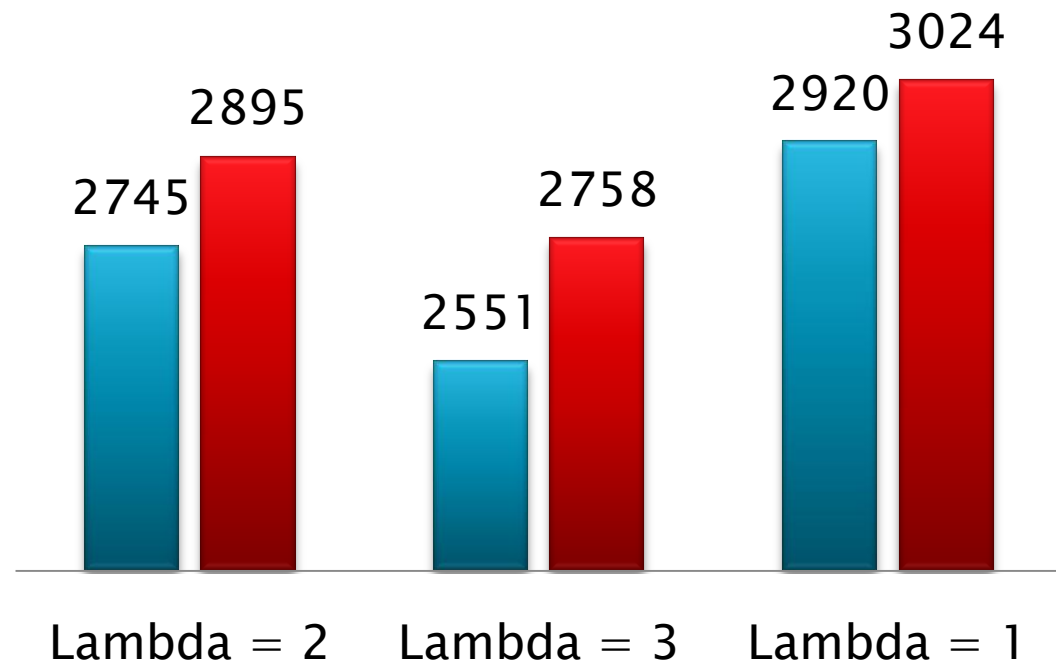
# The Simulation

- ▶ The revenue, the costs and the size of the restaurant is decided arbitrarily.
  - ▶ The user-defined parameter are found experimentally
  - ▶ Customers given by Poisson distribution
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# Improved vs Basic

## Five Periods

Basic Improved



Improved model yields  
always better results

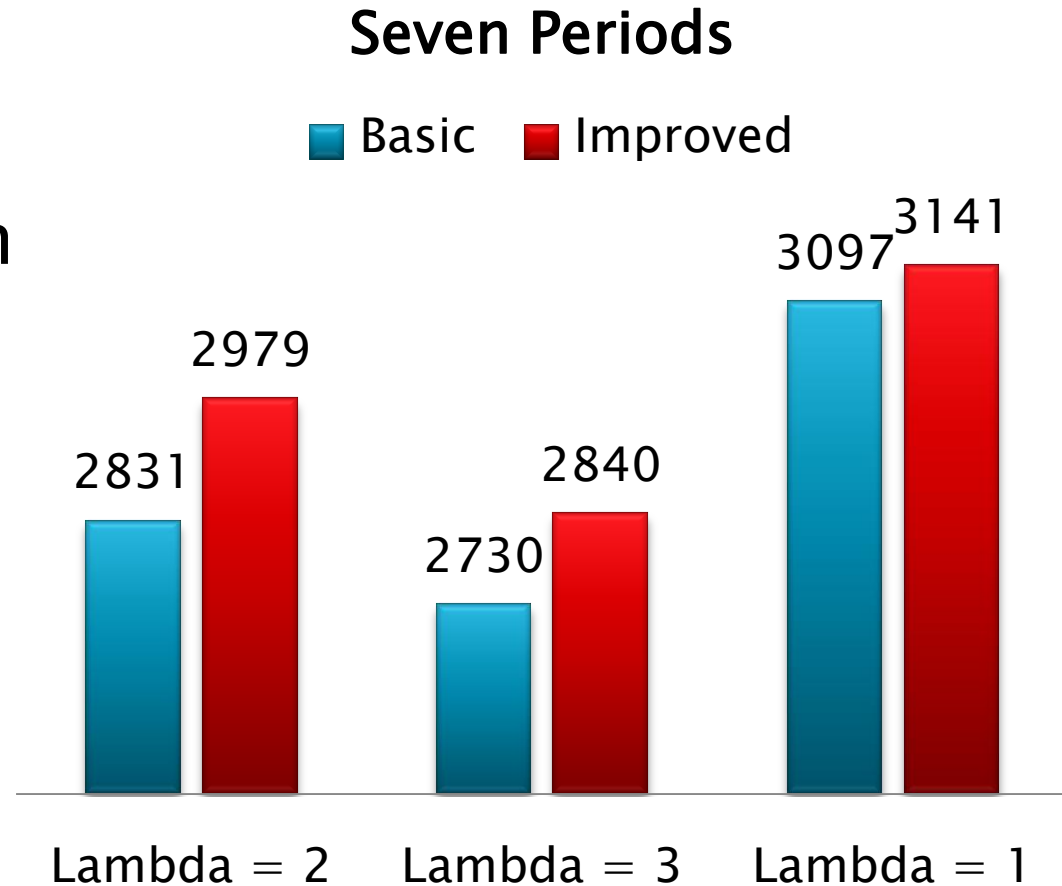
The values of the basic  
model are more  
scattered



# Using smaller periods

The use of smaller periods will produce an increase in revenue

Because of the gained flexibility

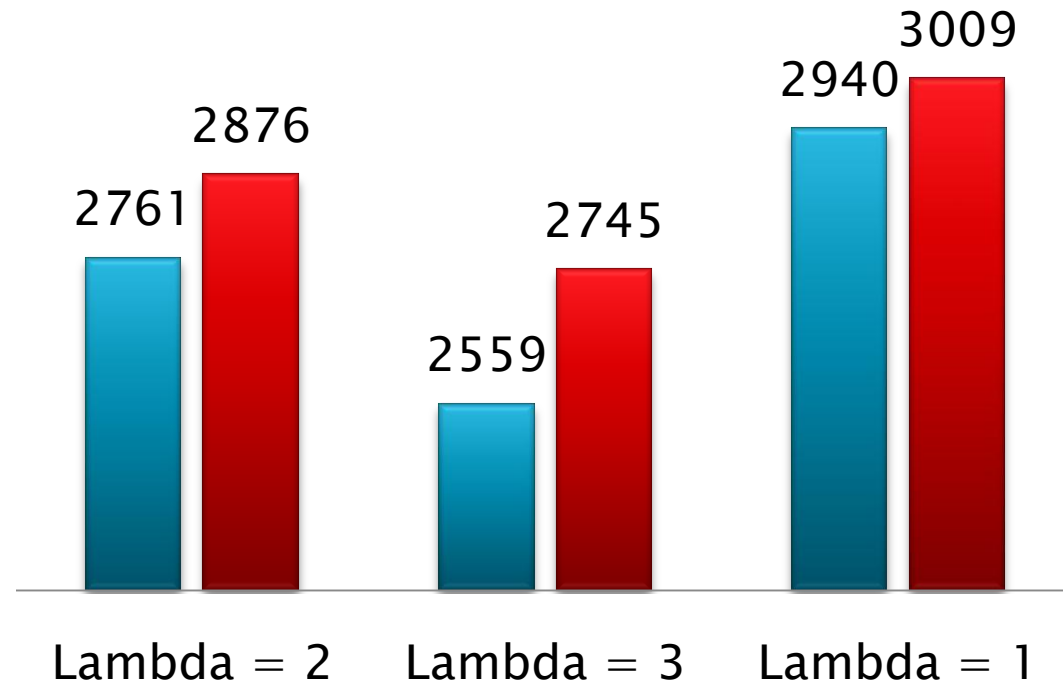


# Variable time at tables

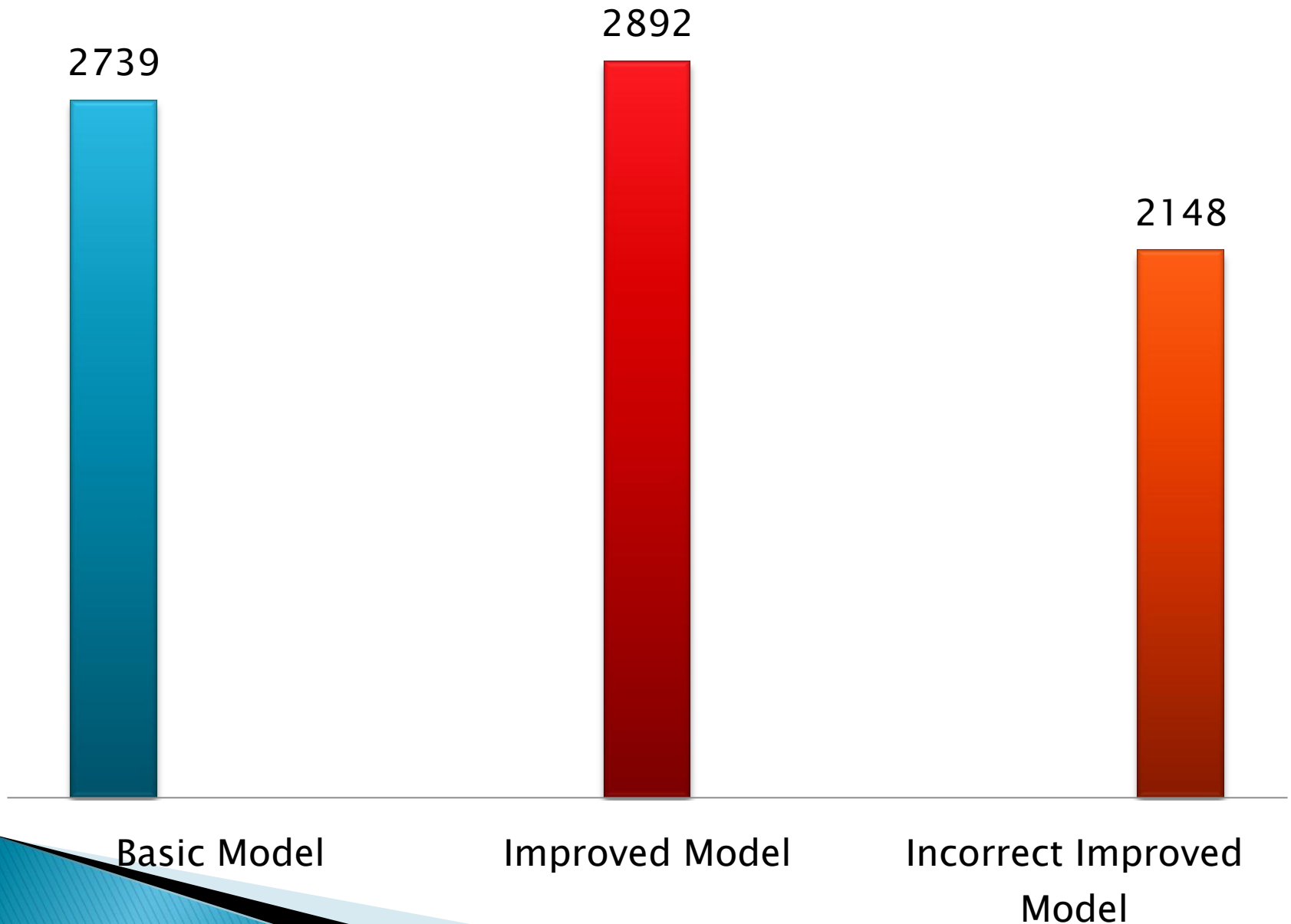
■ Basic ■ Improved

Very small shrinkage of the difference

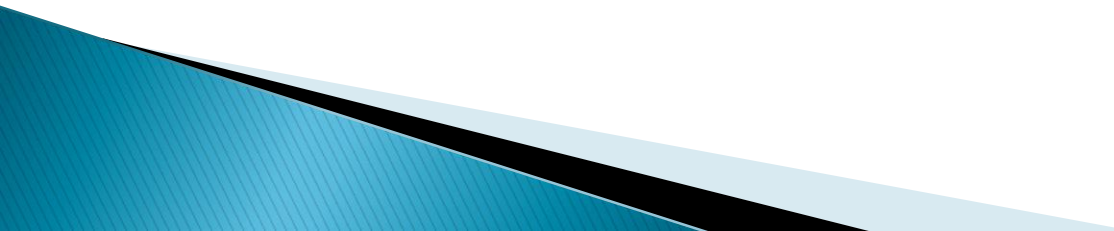
Because of difference between expected and real customers



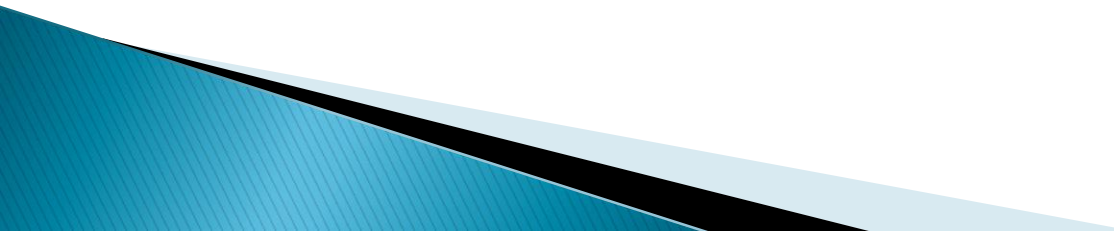
# Wrong estimations



# Future possible additions

- ▶ The models handle quite well reservations, it simply can leave out the reserved tables
  - ▶ A possible future improvement could be to consider the possibility that the party will arrive late or that there is a no-show
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# Final Considerations

- ▶ The improved model is preferable with respect to the basic model when there are correct estimations
  - ▶ Using smaller periods leads to better results
  - ▶ The use of an average time does not effect greatly the results
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**Thank you for your  
attention!**

